

# Extracting Smart Contracts Tested and Verified in Coq

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COBRA  
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# Motivation: smart contracts

**Smart contracts (SCs):**

**programs in a general-purpose language running “on a blockchain”**

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What is so special about them?

- Manage money: auctions, crowdfunding, multi-signature wallets, . . .
- Immutable.
- Code is Law.
- Call other (possibly malicious) contracts.
- Flaws may result in huge financial losses:
  - The DAO  $\sim$  \$50M — hacker attack.
  - Parity's multi-signature wallet  $\sim$  \$280M — bugs in the library code.

- Contracts are (partial) state transition functions:

```
contract : CallCtx * Msg * State -> option (State * Action list)
```

- A *scheduler*

- updates the state;
- handles transfers and calls to other contracts in `Action list`.

Examples of such languages:

LIGO (Tezos), Liquidity (Dune), Scilla (Zilliqa), Sophia (Æternity), etc.

# From Coq to blockchain

- Smart contract verification is crucial.
- Coq is well-suited for functional smart contracts.
- We want to do all the development in Coq.
- Use ConCert for verification.<sup>1</sup>

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**Solution:** Code extraction!

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## Extraction in Coq

- Supports extraction to OCaml, Haskell and Scheme.
- General idea: turn computationally irrelevant bits into  $\square$  (a **box**).
- Proofs (propositions) and types appearing in terms become boxes.
- The underlying theory: Pierre Letouzey's PhD thesis.

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- Proofs (propositions) and types appearing in terms become boxes.
- The underlying theory: Pierre Letouzey's PhD thesis.
- **X** Not directly suitable for targeting:
  - functional smart contract languages;
  - functional fragments of multi-paradigm languages (e.g. Rust)
- **X** Current Coq extraction is not verified.
- **✓** MetaCoq erasure is verified!



## MetaCoq: Formalising Coq in Coq

Consists of several subprojects.

- Template Coq — adds meta-programming facilities to Coq:
  - reflects Coq's kernel;
  - quote/unquote.
- PCUIC (Predicative Cumulative Calculus of Inductive Constructions) — meta-theory of Coq.
- Safe Checker — verified reduction machine, conversion checker and type checker for PCUIC.
- **Erasure** — a verified erasure procedure.<sup>2</sup>

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<sup>2</sup>Matthieu Sozeau, Simon Boulrier, Yannick Forster, Nicolas Tabareau and Théo Winterhalter. Coq Coq correct! verification of type checking and erasure for Coq, in Coq.

- A translation from PCUIC (the calculus of Coq) into  $\lambda\Box$ , untyped lambda-calculus with an additional constant  $\Box$ .
- Provides a proof that the evaluation of the original and the erased terms agree.

Missing bits for practical use:

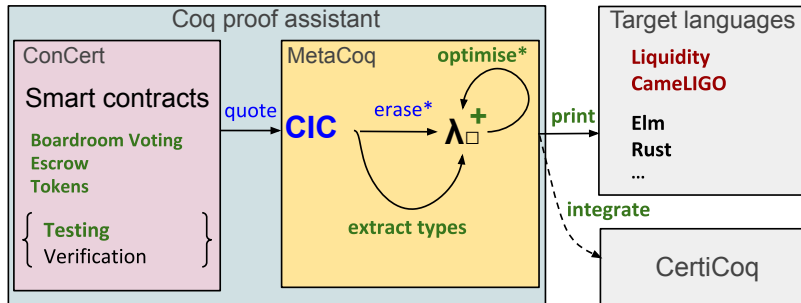
- No erasure for types and inductives.
- Requires more optimisations (e.g. removing boxes).

- Real-world SC implementations:
  - Boardroom Voting.
  - Escrow.
  - Implementation of tokens: EIP/ERC-20, FA2.
- Testing SCs for preliminary bug discovery.
- Executable code generation through extraction.
- Verified optimisations of extracted code.
- Code extraction useful for various targets, not only smart contracts.

# The pipeline

In **green** — our contributions.

Transformations marked with \* — verified.



TCB: the usual of Coq + MetaCoq quote + printing + target language.

We extend MetaCoq:

- Extraction of types and data type definitions (crucial for targeting typed languages)
- A verified optimisation procedure:
  - removes unused arguments of functions;
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On top of this — pretty-printing to various targets.



# Challenges of new targets

- No `Obj.magic/unsafeCoerce` (only available in Rust)
- Non-recursive data types only — Liquidity, CameLIGO.
- Limited support for recursion (e.g. tail recursion only, or no direct access to recursion — only through primitives) — Liquidity, CameLIGO.

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## Consequences:

- Some extracted code will not be well-typed.
- Remapping (cf. `Extract Inlined Constant`) is mandatory for some recursive definitions  
(also crucial for performance on a blockchain)

```
Definition square (xs : list nat) : list nat :=  
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fun xs => Coq.Lists.List.map □□ (fun x => Coq.Init.Nat.mul x x) xs
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*Deboxing* — a transformation that removes redundant boxes.

# When (and why) is it safe to remove boxes?

- Constants: after unfolding  $(\text{fun } x \Rightarrow t) v \sim t$ , if  $x$  is not free in  $t$
- Deboxing is a special case:  $(\text{fun } A x \Rightarrow t) \square \sim (\text{fun } x \Rightarrow t)$ .
- Constructors: boxes don't carry any useful information.
- We remove boxes from applications of constants and constructors.

# The “dearging” optimisation

De-arging: removing the “dead” arguments

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Consists of two stages:

- Analysis: generate masks for constants and constructors (e.g. for `foo`: `mask = [f;t;t]`).
- Dearg: remove arguments using masks, adjust all usage sites.

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- Dearg: remove arguments using masks, adjust all usage sites.

Note:

- if a constant or constructor is not applied “enough” —  $\eta$ -expand.
- With  $\eta$ -expansion, it might not be an optimisation.

# Soundness theorems

Soundness wrt. a big-step call-by-value evaluation relation  $\Sigma \vdash t \triangleright v$

## Theorem (Soundness of dearging)

Let  $\Sigma$ ,  $t$  be a valid environment and a term of  $\lambda\Box$ ,  $\eta$ -expanded according to provided masks, then

$\Sigma \vdash t \triangleright v$  implies  $\text{dearg\_env}(\Sigma) \vdash \text{dearg}(t) \triangleright \text{dearg}(v)$

## Theorem (Soundness of extraction)

Let  $\Sigma$  be a valid CIC environment,  $C$  a constant in  $\Sigma$ ,  $\Sigma'$ ,  $C$  — an environment and a constant after extraction and optimisations, then

$\Sigma \vdash_p C \triangleright C_{\text{tor}}$  implies  $\Sigma' \vdash C \triangleright C_{\text{tor}}$

We get the  $\eta$ -expansion premise in a *certifying* way: quote a term, expand it, unquote back and generate a proof.

# Matching the semantics

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Semantic discrepancies between  $\lambda\square$  and targets related to  $\square$ .

- Applied  $\square$ : if  $t_1 \triangleright \square$  and  $t_2 \triangleright v$  then  $(t_1 \ t_2) \triangleright \square$ .

Requires unsafe features — impossible in most our targets.

So, we have to pick  $() : \text{Unit}$ .

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Guarantees (given the TCB):

extracted program type checks  $\longrightarrow$  gives the same result as the original.

# A counter contract

```
Inductive msg :=
```

```
  Inc (_ : Z)  
| Dec (_ : Z).
```

```
Definition storage := Z.
```

```
Definition pos := {z : Z | 0 <? z}.
```

```
Program Definition inc_counter (st : storage) (inc : pos) :  
  {new_st : storage | st <? new_st} := st + inc.
```

```
Next Obligation. (* proof omitted *) Qed.
```

```
...
```

```
Program Definition counter (msg : msg) (st : storage) : option storage :=  
  match msg with  
  | Inc i ⇒ match (bool_dec (0 <? i) true) with  
    | left h ⇒ Some (inc_counter st (exist i h))  
    | right _ ⇒ None  
    end  
  | Dec i ⇒ ...  
  end.
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```
type Msg
  = Inc Int
  | Dec Int

type alias Storage = Int

type Sig a = Exist a

type alias Pos = Sig Int

proj1_sig : Sig a → a
proj1_sig e = case e of Exist a → a

inc_counter : Storage → Pos → Sig Storage
inc_counter st inc = Exist (add st (proj1_sig inc))
...
counter : Msg → Storage → Option Storage
counter msg st =
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# Extracted code

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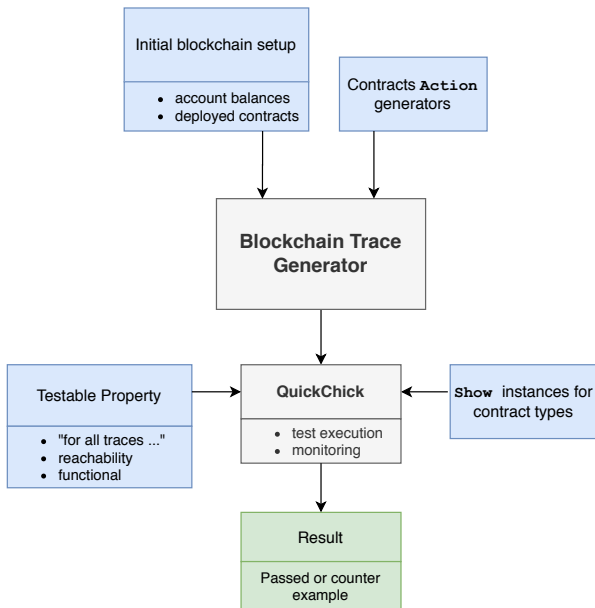
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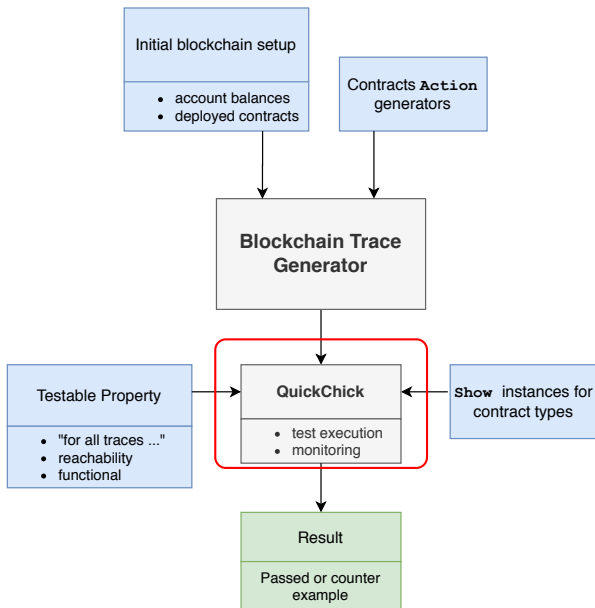
“Logical” bits are erased

- We have extracted several SCs:  
counter, crowdfunding, prototype DSL interpreter, escrow.
- Extraction to Elm:  
list functions from Coq's `stdlib`, counter, `safe_head` (false elim), the Ackermann function (well-founded recursion).
- Liquidity and CameLIGO have many restrictions, requires remapping.
- Elm is closer to  $\lambda$ , extraction is more principled.
- Rust: several examples from Coq's `stdlib`, small examples with dependent types, graph coloring (from the CertiCoq benchmark) — WIP.

# Overview of the Testing Framework

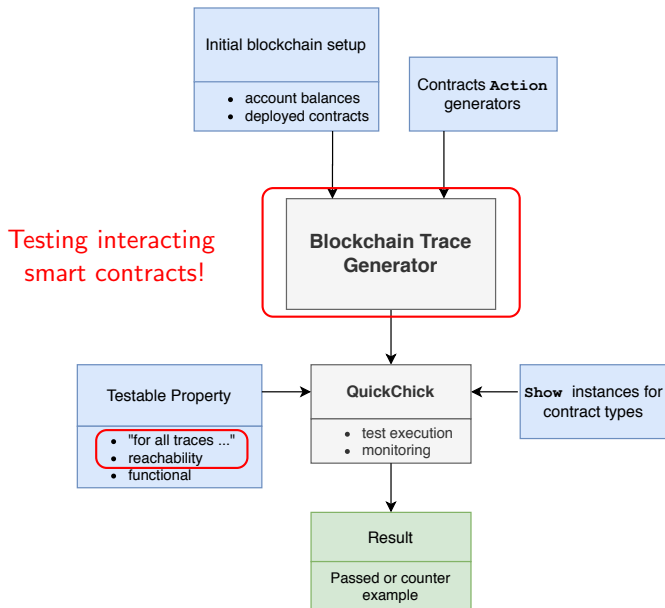


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# Testing Smart Contracts

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- Allows for finding bugs earlier, helping the verification efforts.
- The first to support testing on execution traces.
- Case studies: Tokens (ERC20, FA2), Escrow, Congress, UniSwap.
- We have (re-)discovered many known vulnerabilities/bugs.

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## Tricky bits

- Requires specialised generators defined manually (otherwise too many discards).

- Boardroom voting
  - computes a public tally from private votes;
  - tallying is based on finite field arithmetic;
  - verified, extraction — WIP.
- Escrow
  - a common contract in “decentralised finance” (DeFi);
  - tested, verified and extracted.
- Tokens
  - widely used to represent various assets;
  - tested and extracted.

# Conclusions and Future work

- Practical use of the MetaCoq's erasure, thanks to our extensions.
- Verified optimisations of the extracted code.
- A step towards verified extraction framework.
- New extraction languages: Liquidity, CameLIGO, Elm and Rust.
- Smart contract testing on execution traces.
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## What's next?

- More optimisation passes.
- Inserting type coercions, if supported by a target language.
- Change erasure to remove the “applied box” problem.

Thank you!